1 Revised

- 3 Culture-Independent Analysis of Aerosol Microbiology in a Metropolitan Subway
- 4 System
- 5

2

6 **Running title:** Subway bioaerosol microbiology

- 7
- Charles E. Robertson^{1#}, Laura K. Baumgartner^{1#§}, Jonathan K. Harris², Kristen L.
 Peterson¹, Mark J. Stevens², Daniel N. Frank³, and Norman R. Pace^{1*}

10

- ¹¹ ¹ Department of Molecular, Cellular, and Developmental Biology. University of Colorado,
- 12 Boulder, CO USA.
- ¹³ ² Department of Pediatrics, University of Colorado School of Medicine, Aurora, CO USA.
- ³ Division of Infectious Diseases, University of Colorado School of Medicine, Aurora, CO
 USA.
- 16

* Corresponding author. Mailing address: Department of Molecular, Cellular, and
Developmental Biology, University of Colorado, Boulder, CO, USA 80309-0347. Phone:
(303) 735-1864. Fax: (303) 492-7744. Email: norman.pace@colorado.edu.

20

[#] Contributed equally to study.

22

23 [§] Current address: Front Range Community College, Longmont, CO 80501

24

25 Keywords: Pyrosequences / Sanger sequences / rRNA phylogeny / aerosol bacteria /

26 subway bacteria

<u>AEM</u> Accepts published online ahead of print

28 ABSTRACT

29

30 The goal of this study was to determine the composition and diversity of 31 microorganisms associated with bioaerosols in a heavily trafficked metropolitan subway 32 environment. We collected bioaerosols by fluid impingement on several New York City 33 subway platforms and associated sites in three sampling sessions over a 1¹/₂ year period. The types and quantities of aerosolized microorganisms were determined by 34 culture-independent phylogenetic analysis of small-subunit ribosomal RNA gene 35 36 sequences, using both Sanger (universal) and pyrosequencing (bacterial) technologies. 37 Overall the subway bacterial composition was relatively simple; only 26 taxonomic 38 families made up ~75% of sequences determined. The microbiology was more or less 39 similar throughout the system and with time, and most similar to outdoor air, consistent with highly efficient air mixing in the system. Identifiable bacterial sequences indicated 40 41 that the subway aerosol assemblage was composed of a mix of genera and species 42 characteristic of soil, environmental water, and human skin commensal bacteria. 43 Eukaryotic diversity was mainly fungal, dominated by organisms of types associated with wood rot. Human skin bacterial species (at 99% rRNA sequence identity) included 44 45 the Staphylococcus spp. S. epidermidis (the most abundant and prevalent commensal of the human integument), S. hominus, S. cohnii, S. caprae and S. haemoliticus, all 46 47 well-documented human commensal bacteria. We encountered no organisms of public 48 health concern. This study is the most extensive culture-independent survey of subway 49 microbiota so far and puts in place pre-event information required for any bioterror 50 surveillance activities or monitoring of the microbiological impact of recent subway 51 flooding events. 52

- 53
- 54
- 55
- 56 57
- 58

60

The microbiological quality of the air we encounter daily, and depend upon 61 62 absolutely, is a significant yet little-addressed societal concern. Regulatory focus on air 63 quality has been on chemical and particulate materials, which are readily measured. 64 However, there is comparably little knowledge of the nature of the aerosolized 65 microorganisms and microbial products that occur in different public settings and to 66 which the public is exposed daily. Because many public places concentrate large numbers of humans and therefore may be key locales for transmission of natural 67 pathogens or deliberately released agents, understanding the microbial ecology of 68 69 bioaerosols in public settings is critical for public health, occupational health, and 70 biodefense. For instance, prior knowledge of composition, sources, and temporal and 71 spatial dynamics of bioaerosol microbes is essential for tracking pathogen dispersal in 72 public settings.

73

One public arena through which large numbers of people pass daily is the municipal subway system. Subway facilities have been established by major metropolitan areas throughout the world. New York City (NYC) subways, for instance, had a ridership of 1.6 billion in 2011 (1). The huge number of people exposed to the subway environment underscores the importance of developing some understanding of the microbiological air quality of subway platforms.

80

The results of previous studies emphasize that airborne particulate materials in 81 82 subways are different from what is found on city streets or in other indoor environments. 83 This is particularly due to aerosolized metallic dust, which most likely is generated by 84 the action of iron train wheels on tracks (2)(3)(4)(5)(6)(7). Chillrud and colleagues have 85 examined the effects of NYC subway exposure on children (8) and subway workers 86 (9)(10), and saw no health effects. Birenzvinge et al. showed that the load of particulate 87 matter in the air on the subway platforms was correlated to the frequency of train traffic 88 (11). The unusual particulate quality of the subway environment may indicate also that the microbial contents of subway aerosols differ from those detected in other indoor oroutdoor environments.

91

Thus far, studies of aerosol microbiology in the subway environment have focused primarily on culture-dependent techniques, most notably viable counts of bacteria and fungi, sometimes with biochemical or molecular identification of cultivars (3)(12)(13)(14)(15). However, studies that focus on colony forming units likely identify only a small fraction of actual microbial contents because most environmental microbes are not cultured using standard techniques (16). Consequently, there is little general perspective on the nature of microorganisms that might be encountered in subway air.

100 In order to gain some overview of the nature of the microbial load of a subway 101 system independently of culture, we examined the contents of aerosols collected on 102 several New York City subway platforms and associated sites (terminal, park and 103 unused platform) during three sampling sessions over a 1 1/2 year period. The 104 compositions of aerosolized microbial loads were determined by culture-independent 105 phylogenetic analysis of small-subunit rRNA gene sequences, using both Sanger and 106 454 sequencing technologies. The longer Sanger sequences provide for more accurate 107 phylogenetic identification, whereas pyrosequences provide more comprehensive 108 sampling of aerosol microbiology.

109

110 Materials and Methods

111

112 Air sampler setup, cleaning and blanks.

Air was sampled with a custom-modified Omni 3000 fluid impinger (Innovaprep LLC, Drexel, MO), modified to minimize tubing and allow full removal of tubing for cleaning and sterilization. Omni particle capture efficiency ranges from 40% for 0.5 μm particles to >90% for >3 μm particles (17) The device was chosen because of its relatively high capture rate of bacteria-sized particles, high volume of air passage (250-300 l/min in this study) to minimize sampling time, and relatively quiet function, to minimize conspicuity during this public sampling campaign. 120

121 Empty sampling cartridges were sterilized by irradiation in a UV Stratalinker 1800 122 (Stratagene, La Jolla, CA), then molded shut with chloroform. Cartridges were filled 123 with a filter-sterilized impinging solution, which consisted of phosphate buffered saline 124 (PBS; 137 mM NaCl, 10 mM Phosphate, 2.7 mM KCl, pH 7.4) and 0.005% Tween in 125 diethylpyrocarbonate (DEPC) treated water. Blank cartridges were prepared at the same time as the sample cartridges, carried during sampling, and processed in the 126 127 same manner as the air samples. None of the cartridge blanks produced amplifiable 128 DNA. The average air-sampling rate was ~300 l/min. During sampling, liquid volume lost 129 to evaporation was replaced with DEPC-treated water. The air sampler was cleaned 130 between stations by replacing all of the tubing with sterile tubing and cleaning the 131 contactor and ports with DEPC-treated water and alcohol (isopropanol wipe then 132 washed with 70% ethanol) and air-dried. Cleaning blank samples were taken by filling 133 the sampler (contactor and tubing) with 5 mL DEPC-treated water, which was allowed to 134 sit in the sampler for 5 minutes and then extracted by sterile syringe from the sampling 135 port. The cleaning blanks were filtered and extracted in the same fashion as the air 136 samples; none of the blanks produced amplifiable DNA.

137

138 **DAPI Counts.**

139 Aliquots of sample fluid were adjusted immediately following sampling to 4% 140 formaldehyde for direct cell counts, and held and shipped overnight on wet ice to the 141 laboratory. Aerosolized iron in most subway air samples interfered with microscopic 142 counts and was removed before counting: samples were vortexed gently for 30s, then 143 placed against a magnetic rack for ~1 min. Sample fluids were carefully removed with a 144 pipette and a known volume filtered through a 0.2 micron black polycarbonate filter. 145 The filter was placed on a slide, flooded with 10 μ g/ml diamino-2-phenylindole (DAPI) 146 for 5-10 minutes, washed with two, 2-min washes of 10 mM Tris-CI, 1 mM EDTA, pH7.4 147 (TE) and slides were counted at 400x.

148

149 DNA Extraction, Amplification, and Sequencing (Sanger and 454).

Most (~85%) of the sample fluid from each collection was filtered through 0.2 μm polycarbonate filters (Millipore Isopore, Billerica, MA)), which then were placed in sterile microcentrifuge tubes, immediately frozen in liquid nitrogen and shipped frozen to the laboratory, where they were stored at -80°C until processed.

154

Samples were processed to remove particulate iron before DNA extraction by dissolving the filter in phenol, chloroform, and Buffer B (200 mM NaCl, 200 mM Tris-Cl pH 8.0, 20 mM EDTA, 5% SDS) while vortex mixing. Samples were centrifuged at 100 x g for 2 minutes and then placed against a strong magnet. All liquids were removed to a new sterile tube, leaving the magnetic iron behind. This was repeated and the sample was then placed in a tube with zirconium beads for DNA extraction by bead beating with two volumes of buffer-saturated phenol and ethanol precipitation of nucleic acids.

162

163 Extracted genomic DNA was amplified for cloning by PCR with the (nominally) universal small subunit rRNA gene primers 515F and 1391R (18). PCR reactions were 164 conducted at 94 °C for 2 min, followed by 30 cycles at 94 °C for 20 s, 52 °C for 20 s, 165 166 and 65 °C for 1.5 min, followed by a 65 °C elongation step for 10 min. Each 50-µL 167 reaction contained 10 µL Eppendorf 2.5× HotMasterMix (Eppendorf, New York, NY), 10 168 µL water, 0.05% BSA (Sigma-Aldrich, St. Louis, MO), 100 ng of each oligonucleotide 169 primer, and 1–5 ng of DNA template. Triplicate PCR reactions were conducted for each 170 sample and pooled before purification with the Montage gel purification system 171 (Millipore). In some (9/27) gel purifications of PCR products 16S and 18S bands were 172 processed and analyzed separately. For most of the universal libraries, the mixture of 173 the two was processed. Some samples were not effective as templates and were not 174 analyzed further. PCR-amplified rRNA genes were cloned with Topo-TA according to 175 manufacturer's instructions (Life Technologies, Carlsbad, CA) and Sanger sequencing 176 was conducted on an Amersham MegaBACE 1000 capillary sequencer following the 177 manufacturer's protocols.

178

179DNA samples also were analyzed by pyrosequencing on a Roche 454 GS-FLX180platform. DNAs were amplified in three independent reactions using barcoded primers

181 (27F-338R) (19). Negative PCR controls for each primer were assayed in parallel and 182 did not exhibit bands in agarose gels. The three independent reactions were pooled 183 and amplicons were confirmed by agarose gel electrophoresis. DNA contents of pools 184 were normalized using the SegualPrep Normalization plate (Life Technologies), and 185 equal amounts mixed to construct the amplicon pool (20). The amplicon pool was 186 concentrated by evaporation, size selected by electrophoresis on a 1.5% agarose gel 187 (Tris-acetate EDTA buffer) and gel purified by Montage kit (Millipore) prior to 188 sequencing. Pyrosequencing was conducted per manufacturers protocols using Roche 189 454 titanium chemistry.

190

191 Sequence Analysis.

192 Sanger sequences were quality filtered and assembled with XplorSeg (21). Raw 193 pyrosequences were quality filtered and sorted into their respective barcoded libraries 194 with BARTAB (22). Filtering for both Sanger and pyrosequence data removed 195 nucleotides with mean Q < 20 at 5' and 3' ends and over a 10 nt window; sequences 196 with >1 ambiguous base were discarded; and all sequences of length < 200 nt were 197 discarded. Infernal (23) and ChimeraSlayer (24) were used to screen bacterial 198 sequences as described previously (25). Taxonomic classification of all sequences was 199 done with the classifier functionality of standalone SINA using the Silva108 non-200 redundant database as reference (376,437 sequences which are the 99% cluster 201 representatives of Silva108, (26)). Ecological statistics (such as Species Observed 202 (27)), pie charts, and heatmaps were prepared with the Explicet software package (CER 203 manuscript in preparation. Software available upon request to author.) Sanger 204 sequences have been deposited in GenBank under the accession numbers JX394222-205 JX397762 and pyrosequences have been deposited in the Short Read Archive with 206 accession number SRA055336 (BioProject Accession number PRJNA169671).

207

208 Determination of potential sources of DNA was done by BLAST analysis of all 209 pyrosequences against three separate databases composed of long sequences 210 (≥1200nt) associated with the Human Skin Microbiome study (28), sequences in Silva 211 108 whose isolation source metadata tag contained the word "soil", and sequences in Silva 108 whose isolation source metadata tag contained the word "water". To be considered a BLAST database match, pyrosequences were required to have a minimum of 95% overlap with the BLAST database hit sequence, a minimum bit score of 50 and either 95% or 99% identity with the respective BLAST database hit sequence. We did not use tools that compare fingerprints of ecosystems with bioaerosol samples because air is an assemblage, not a specific microbiome.

218

219 Results

220

221 The microbiological contents of nominally similar environmental samples tend to 222 vary site-to-site and over time. Variation is particularly expected in the subway setting, 223 a scattered collection of potentially more or less sequestered spaces connected by 224 kilometers of track tunnels. In order to explore both spatial and temporal aspects of the 225 microbiology of the NYC subway system, we collected air samples at seven subway 226 stations (specified in figures and located as shown in Figure S1) and three adjacent 227 sites in lower Manhattan over a 1 1/2 year period (2007-2008). Two, 5-6 m³ samples 228 were collected at each subway station for each sampling timepoint, one from each end 229 of the platform, using a metered, high-volume fluid impinger. The impinger was 230 modified so that all internal surfaces could be exposed for cleaning or disposal following 231 their use (Materials and Methods).

232

233 Sampling parameters and other metadata are summarized in Table S1. Microbial cell counts (Materials and Methods) of typically 1-4x10⁴ cells/m³ were 234 observed throughout the system (average, 2.2x10⁴ cells/m³, Table S1). These directly 235 236 counted microbial loads were typical of outdoor air samples taken at the same time and 237 at the low end of loads typically encountered in indoor environments such as occupied buildings (10⁴-10⁵ cells/m³) (29)(30)(31). On the other hand, direct counts of 238 239 aerosolized subway bacteria are much higher, ~100-fold higher, than colony-forming 240 counts encountered in subway environments, which are typically several hundred CFU/m³ in different subway systems (14)(15)(13). We see no clear patterns of variation 241

in cell counts by season, station or extent of local traffic (light vs. heavy, Table S1) inthis sampling.

244

245 The phylogenetic distribution of aerosolized microbes in each specimen was 246 determined by analysis of small-subunit (SSU) rRNA gene sequences. Total nucleic 247 acids were extracted from impinger fluids using a bead-beating protocol and processed 248 for Sanger or for pyrosequence analysis (Materials and Methods). Clone libraries for 249 Sanger sequencing were constructed from PCR products obtained using the (nominally) 250 universal primer set 515F-1391R; pyrosequencing libraries were developed using 251 bacteria-specific barcoded primers targeting the V1-V2 region of the small subunit rRNA 252 gene. The longer Sanger sequences (700-800 nt in this case) provide for relatively 253 accurate phylogenetic assignments and a three-domain census. The more numerous, 254 but shorter (~200 nt) pyrosequences provide a broader census assessment of bacteria. 255 Overall 3,541 Sanger sequences and 60,707 pyrosequences were determined and 256 deposited in GenBank.

257

258 **Phylum-level diversity of bioaerosols**

259 The phylum-level diversities encountered among Sanger (universal) and 260 pyrosequences (bacteria-only) were similar throughout the examined subway sites and 261 similar to outdoor air samples (Union Square Park, as summarized in Figure 1. 262 Qualitatively similar subway and outdoor bacterial diversity was found in the Sanger (Fig. 263 1A and 1B) and pyrosequence analyses (Fig. 1C and 1D), although there was some 264 quantitative variation. Few of the sequences (<1%) were identical to sequences in the 265 databases, but many were related to database sequences at the genus or even species 266 taxonomic levels (below). Based on the results from PCR amplification with universal 267 primers, bacterial (65%) and fungal (34%) sequences dominated the overall subway 268 rRNA assemblage (Fig. 1B). Archaeal sequences, consisting of a few crenarchaeotes 269 and methanogens with no specific known relatives, were rarely encountered (<1% of 270 total). Collectively the main bacterial sequence diversity observed in the subway 271 environment was remarkably simple, mainly comprising only four of the ~100 known 272 bacterial phyla: Actinobacteria, Firmicutes, Bacteroidetes and Proteobacteria, with only

minor contribution from other phyla. Only a few sequences fell into candidate phyla
(OP10 and TM7) with no cultured representation. A full abundance-ranked list of
bacterial taxa detected in the study is compiled as Table S2.

276

277 Although simple at the phylum level, the diversity of subway air samples was 278 more complex at lower taxonomic levels. Comparison of taxon collectors curves (Fig. 2) 279 generated from pyrosequence and Sanger datasets indicates that the Sanger sequence 280 set, at 700-800 nucleotides in length, substantially under-samples the microbial diversity 281 relative to the pyrosequencing data set (~200 nucleotide length), although the most 282 abundant sequences are expected to occur in the Sanger data set (32). However, even 283 the pyrosequencing dataset did not exhaustively sample the microbes present in the 284 system as a whole, as indicated by the continuous increase in observed taxa (Sobs) 285 with ongoing sampling of sequences (Fig. 2). This is a common theme in environmental 286 sequence surveys; the pool of rare sequences, the "rare biosphere," is always extensive 287 (33). Nonetheless, pyrosequencing was sufficiently extensive to cover the majority of 288 the microbial diversity encountered. Consequently, we focus on the pyrosequences for 289 site-to-site statistical comparisons.

290

291 Bacterial Diversity

292 Despite the considerable diversity of rRNA sequences encountered in subway air 293 samples, only 26 family-level taxa comprised most (~75%) of the sequence types 294 observed; their distributions in the different stations, abundance-ranked by heat map, 295 are shown in Figure 3. (Table S1 lists all taxa encountered to 0.01% of total.) At this 296 taxonomic level of analysis, the makeup of the subway microbiology was generally 297 similar to that observed outdoors (Union Square Park) in an area with considerable 298 human traffic. Most of the abundant taxa occurred throughout the sample set at 299 consistently higher levels than other taxa, but the distributions of the abundant taxa 300 varied between different subway stations and times of sampling. For instance, 301 taxonomic families that were particularly abundant in one or more samples occurred in 302 other samples as well, but in lesser relative abundance (Fig. 3).

304 We explored potential correlations in the distributions of the bacterial diversity 305 between different subway sites using standard ecological beta-diversity indices (i.e., 306 Morisita-Horn and UniFrac), but identified few associations. As shown in Figure 4, a 307 Morisita-Horn analysis of similarities between the compositions of the different samples, 308 microbiotas tended to be similar in general (M-H index 0.6-0.8; identical communities 309 would have an index = 1.0). The Morisita-Horn analysis does indicate a few pairs of 310 stations with exceptionally high similarities (M-H index >0.9), which in some instances can be rationalized by proximity. However, potential correlations such as station 311 312 proximity tend to be inconsistent in subsequent samplings.

314 A few samples in Figure 4 also are exceptionally different from the others. These 315 can be explained largely by idiosyncratic abundances of particular phyla. For instance, 316 dissimilarity between the GC456:1:2008-08 and other samples (Fig. 4; M-H index <0.3) 317 was driven by an unusual abundance of Enterobacteriaceae sequences (Fig. 4); 318 dissimilarity of the BowlingGreen:1: 2008-08 sample from others resulted from 319 idiosyncratic abundances of Microbacteriaceae, Nocardioidaceae and 480-2 (an 320 environmental actinobacterial sequence clade with no named representative) in that 321 sample (Fig. 3). Moreover, the somewhat unusual microbial compositions observed for 322 the GC456:2:2008-08 and BowlingGreen:1:2008-08 samples was not reproduced with 323 samples taken at the same sites but a year or more earlier (GC456:March2007, Bowling 324 Green:August2007), when the microbiology of those sites was generally similar to that 325 of other stations sampled. In general, however, any apparent correlations have no 326 particular and consistent explanations in terms of the sites or timepoints sampled. 327 Samples taken at the same sites months or a year apart usually had no specific 328 relationships; even samples taken on the same dates at opposite ends of particular 329 platforms (e.g. TimesSquare:1:2007 and TimesSquare:2:2007, and GC456:1:2008-08 330 and GC456:2:2008-08) were no more correlated with each other than with other 331 samples (M-H <0.9).

332

313

333 Sources of Bacterial Diversity

AEM Accepts published online ahead of print

334 At low taxonomic levels, genera and species, the sequence diversity seen 335 throughout the subway system was complex. However, most of the sequences fall into 336 taxonomic groups that also contain described and named species (Fig. 3): respectively, 337 65% and 70% of pyrosequences and Sanger sequences were classifiable to the genus 338 level. This is an unusually detailed taxonomic result with environmental samples, which 339 typically yield many sequence types not in reference databases (34). The result 340 indicates that the diversity we detected generally belongs to a relatively intensively 341 documented portion of the bacterial SSU rRNA tree. Many of the sequences 342 determined were nearly identical to rRNA gene sequences of named species and, in 343 some cases, the nature of those species points to the sources of the microbiology 344 encountered in the system.

345

346 In order to gain some further perspective on the sources of the sequences, we 347 used BLAST analysis to compare the subway sequences to those of databases 348 representing other environments. As general reference environments, we considered 349 human skin, soil, and water (Materials and Methods). Figure 5A shows comparisons of 350 the subway dataset with those environmental datasets at 95% sequence overlap and 351 two levels: 95% sequence identity, approximately the genus-level; and 99% identity, a 352 stringent species-level relationship. The results of the comparisons establish the 353 general propensity of identifiable sequences to sort with both environmental (soil and 354 water) and human skin microbiota, as indicated. Approximately 20% of identifiable 355 species are associated with human skin. Additional detail is provided in Figure 5B, 356 which indicates that sequences of identifiable human skin microbiota in the subway 357 station air seem derived mainly from the foot, hands, arms, and head. Details of body 358 site representation for the different stations are given in Supplementary Figure S2. 359

360 One conspicuous example of putative human skin microbes in subway aerosols 361 is the most abundant taxonomic family throughout the system (Fig. 3), the 362 *Staphylococcaceae*. Overall, 85% of the sequences representing *Staphylococcaceae* 363 were members of the genus *Staphylococcus* in the Silva 108 database. Most of the 364 observed *Staphylococcus* spp. sequences were not affiliated with named species, but 365 rather represented a broad phylogenetic distribution within the genus. However, 475 of 366 the ~3000 Staphylococcus spp. sequences were identified (99% sequence identity) with 367 5 well-studied species: S. epidermidis (the most abundant by ~4-fold and the most 368 abundant and prevalent commensal on the human integument), S. hominis, S. cohnii, S. caprae and S. haemoliticus. These are all well documented human commensal 369 370 bacteria, associated mainly with skin. Staphylococcus spp. were particularly abundant in 371 areas of human habitation, for instance Grand Central Station mezzanine 372 (GCMez:1:2007-08) and Times Square stations (Fig. 3). Similar human-related 373 microbiological signatures also were represented in other of the family groups cited in 374 Figure 3. The *Micrococcaceae* sequence collection, for instance, includes *Kocuria* spp., 375 Micrococcus spp. and others known as human skin microbiota.

377 Of course, many organisms related to known environmental microbes also were 378 identifiable: for instance ~20% of the Micrococcaceae sequences correspond to those of 379 Arthrobacter spp., which are related to common soil organisms. The Moraxellaceae 380 sequences, as further example, include many Acinetobacter spp. and Psychrobacter 381 spp. sequences related to known soil and water microbes. Overall, as summarized in 382 Figure 5A, the bacterial diversity of the subway system aerosol that can be identified as 383 to source was comprised mainly of soil and water microbes with a significant overlay of 384 human skin microorganisms. No pathogens beyond those associated with human 385 commensal organisms were observed.

386

376

387 Eukaryotic diversity

388 The Sanger sequences based on universal primers provide the only perspective 389 on aerosolized eukaryotic diversity detected in the study. Nearly all (96%) of the 390 eukaryotic sequences corresponded to diverse fungi. The few eukaryotic rRNA 391 sequences beyond fungal sequences included insect, plant, rodent, and a few protist 392 sequences. Fungal sequences comprised ~35% and 40% of Sanger sequences of 393 subway and outdoor rRNA genes, respectively (Fig. 2). These relatively high 394 abundances of fungal rRNA genes compared to bacterial genes cannot be taken as 395 cellular (or spore) frequencies relative to bacteria, however, due to the common

occurrence of large numbers of rRNA genes per genome in fungi, typically 100 or more
(35)(36). In contrast, bacteria are expected to have only a few rRNA genes (37).
Consequently, the abundance of fungi relative to bacteria in cell numbers probably is
overestimated in these sequence sets by 10-100 fold. A low frequency of fungus spores
observed in direct counts was consistent with that expectation.

401

402 The taxonomic breakdown of the fungal sequences detected was complex and, 403 as with bacterial sequences, few sequences corresponded exactly to a named organism 404 (Fig. 6). All, however, fall into more or less well-described groups including mushrooms 405 (e.g. representatives of Agaricomycetes), mildews (e.g. members of Eurotiales), 406 saprophytes and plant pathogens (e.g. Capnodiales), yeasts (e.g. Saccharomycetales) 407 and wood-rotting fungi (most taxa listed in Fig.6). No sequences of known human 408 pathogens were present in the datasets. Although most fungal sequences were 409 comparable between outside and subway samples, approximately 20% of the fungal 410 sequences in the subway samples had no counterparts in the outside libraries (Fig. 6). 411 Wood rot fungi were common among all the sequences detected, so the increased 412 fungal diversity among the subway samples likely is due to the presence of wooden 413 track structure throughout the system.

414

415 Discussion

416

417 The subway environment, underground and away from light, might seem remote 418 from our usual environment and potentially occupied by distinct or novel kinds of 419 microorganisms. Rather than unusual however, our survey finds that the microbiota 420 encountered in the NYC subway is fairly mundane, essentially a mix of outdoor air with 421 an overlay of human-associated microorganisms typical of the skin. No significant 422 evidence of pathogens or other organisms of concern was obtained, beyond what might 423 be encountered in any human-occupied indoor setting. Thus, this survey provides the 424 pre-event information necessary for surveillance activities for pathogens that might 425 occur or be introduced into the system. The results also provide pre-event information

426 necessary for interpretation of the microbiological consequences of the recent flooding427 of the NYC subway system during Hurricane Sandy in 2012.

428

429 Although subways might be considered confined environments, the similarity of subway air microbiota to that of outside air suggests that the subway air significantly 430 431 equilibrates with outside air on relatively short timescales. There is little or no local air conditioning in the NYC subway. Instead, air movement in the system is driven by 432 433 passive train-pumping, with air taken in and exhausted through street-level ports, the 434 NYC sidewalk grillwork. The general uniformity of microbial assemblages throughout 435 the system indicates good air mixing, a testimony to the efficiency of the train-pumping 436 process.

437

438 We have no information as to the viability of any of the organisms detected by 439 gene sequences. Indeed, direct cell counts as reported here are ~100-fold higher than 440 reported for colony-forming units in other studies of subway aerosols (14), certainly 441 indicating that most of what we identify is not cultured using standard methods. It is 442 possible, perhaps likely, that many or most aerosolized organisms are non-viable 443 because uncontrolled desiccation of bacteria can be lethal (38)(15)(13). Although 444 bacterial and fungal spores are long-lived in desiccated or partially desiccated 445 conditions, in the case of bacteria we see little evidence for the specific selection of 446 phylotypes known for spore formation. For instance, rRNA sequences representative of 447 the spore-forming Bacillaceae family, common soil constituents, are only a minor 448 constituent of the subway assemblage (~11% of total bacteria, Fig. 3). We did not 449 detect any potential bioterror agents, such as the spore-forming organism Bacillus 450 anthracis. On the other hand, health-related concerns are not restricted to virulent 451 microbes, since allergic and hypersensitive responses to bacteria and fungi do not 452 require viable organisms.

453

454 No standing-crop aerosol microorganisms are known, so the microbes detected 455 in this survey are not expected to be a "community" of interacting organisms. Rather, 456 we consider the aerosol microbiota as an assemblage of microbes derived from

AEM Accepts published online ahead of print

457 microenvironment-associated communities the air has contacted. Although most of the 458 microbiology is of unknown origins beyond vague descriptions such as "soil" or "water," 459 the human skin is likely to be a significant microenvironmental source of identifiable 460 aerosolized microbes. This identification is possible because the microbial diversity 461 associated with skin has been characterized intensively by culture and molecularly, and 462 the rRNA sequence database of named skin microbes is large (28). Consequently, we 463 are able to use a stringent criterion, 99% sequence identity, for speciation of subway 464 microbes based on sequence. (Most environmental studies use a more relaxed 97%-465 identity rRNA sequence bin for species-level taxonomic calls, which incorporates a 466 much more diverse collection of organisms than our conservative estimate.) The 99% 467 identity of rRNA gene sequences of many subway microbes with the corresponding 468 sequences of specific human skin commensal microbes is strong evidence for our 469 conclusion that a significant component of subway aerosol microbiology is human-470 derived. This is not surprising; much of the microbiology of human-occupied indoor 471 environments has long been identified with human skin microbiology (39)(15)(40).

472

473 Overall, approximately 5% of subway aerosol sequences correspond specifically 474 to human skin bacterial sequences (Fig. 5). Although our sampling campaign focused 475 on occupied stations, similar results were seen with aerosols collected at an unused 476 station (CityHall, Fig. 3). This indicates that human-associated microorganisms are 477 dispersed throughout the system. This perhaps is surprising considering the large 478 spatial volume of hundreds of kilometers of subway, even in the face of the 479 considerable human traffic. Although shedding of skin flakes carrying microbes is often 480 invoked as sources of human skin microbes, we suggest that convection driven by 481 body-temperature may also be a major factor. That is, we humans all have body 482 temperatures of ~37°C, but when exposed to ambient air we are surrounded by a lower temperature, typically ~20°C. Thus, we all continuously and actively emit a convective 483 484 plume of warm air - carrying our skin microbiology selectively (41).

485

Each sampling event and DNA library analysis was conducted only once, so we acknowledge that any specific variation in microbial contents between the samples 488 might result from statistical flux or intrinsic sampling variation. Nonetheless, although 489 each of the samples is a unique snapshot, the census results are broadly consistent in 490 most samples and they collectively identify the microbiology likely to be encountered in 491 the NYC subway system. We see no consistent evidence for local pockets of specific 492 diversity. Rather, the diversity observed at different sites seems to reflect random 493 draws on a complex assemblage distributed throughout the system.

494

495 The development of "next-generation" sequencing technology has dramatically 496 changed the depth to which we can explore the natural microbial world and the results 497 have provided entirely new perspective on environmental microbial diversity. Early 498 molecular studies of natural microbial diversity tended to be limited by technology and 499 cost to a few hundred sequences, and described only a limited extent of environmental 500 diversity; now far deeper coverage is readily achieved. Sequence surveys such as the 501 current one and many others have revealed that environmental microbiotas consist not 502 simply of collections of specific microbes, "species," but rather complex collections of 503 more or less closely related phylotypes, with little real demarcation between formal 504 taxonomic grades such as genera and species. The results of high-volume sequencing 505 of environmental microbiotas also begin to capture sequences that occur only rarely, a 506 "rare biosphere" that sometimes contains far more phylogenetic diversity than spanned 507 by sequences of the more abundant organisms in the particular sampling (39). For 508 instance, in the current study only four bacterial phyla were the major contributors to the 509 subway aerosol microbiology. However, inclusion of more rare sequences expands the 510 detection to ~12 phyla (Table S2). Although not abundant, these rare sequences 511 potentially represent significant environmental diversity and contribution to the local 512 pangenome pool.

513

514 Acknowledgments

515

516 The authors thank Michael Metz, Mike Gemelli, Charles Burrus and Frank 517 Klimasz of the NYC Metropolitan Transit Authority for their assistance in conducting the 518 sampling campaign. We also thank Kimberly Ross, Piret Koll, and Leah Feazel for

- assistance in sampling, and Dr. Paula Olsiewski of the Alfred P. Sloan Foundation for
- 520 encouragement and support. This study was supported by grants from the Alfred P.
- 521 Sloan Foundation (NRP) and NIH HG005964 (DNF).
- 522

523 Author Contributions

- 524
- 525 Conceived and designed the experiments: NRP, LKB
- 526 Performed the experiments: LKB, KLP
- 527 Analyzed the data: CER, DNF, JKH, NRP, LKB
- 528 Wrote the paper: NRP, DNF, CER, JKH, LKB
- 529

531532 References

533

534 1. http://www.mta.info/nyct/facts/ridership/index.htm#atGlance_s. 535 2. Awad A. Environmental study in subway metro stations in Cairo, Egypt. J. Occup. 536 Health **44**:112–118. 537 Cho JH, Hee Min K, Paik NW. 2006. Temporal variation of airborne fungi 3. 538 concentrations and related factors in subway stations in Seoul, Korea. Int J Hyg 539 Environ Health 209:249-255. 540 4. Jung H-J, Kim B, Malek MA, Koo YS, Jung JH, Son Y-S, Kim J-C, Kim H, Ro C-U. 2012. Chemical speciation of size-segregated floor dusts and airborne magnetic particles 541 542 collected at underground subway stations in Seoul, Korea. J. Hazard. Mater. 213-543 **214**:331-340. 5. Salma I, Posfai M, Kovacs K, Kuzmann E, Homonnay Z, Posta J. 2009. Properties 544 545 and sources of individual particles and some chemical species in the aerosol of a 546 metropolitan underground railway station. Atmospheric Environment **43**:3460–3466. 547 6. Nieuwenhuijsen M. 2007. Levels of particulate air pollution, its elemental 548 composition, determinants and health effects in metro systems. Atmospheric 549 Environment 41:7995-8006. 550 7. Midander K, Elihn K, Wallén A, Belova L, Karlsson A-KB, Wallinder IO. 2012. 551 Characterisation of nano- and micron-sized airborne and collected subway particles, a 552 multi-analytical approach. Sci. Total Environ. 427-428:390-400. 553 8. Chillrud SN, Epstein D, Ross JM, Sax SN, Pederson D, Spengler JD, Kinney PL. 2004. 554 Elevated airborne exposures of teenagers to manganese, chromium, and iron from 555 steel dust and New York City's subway system. Environ. Sci. Technol. 38:732-737. 556 9. Chillrud SN, Grass D, Ross JM, Coulibaly D, Slavkovich V, Epstein D, Sax SN, 557 Pederson D, Johnson D, Spengler JD, Kinney PL, Simpson HJ, Brandt-Rauf P. 2005. 558 Steel dust in the New York City subway system as a source of manganese, chromium, 559 and iron exposures for transit workers. J Urban Health 82:33-42. 560 10. Grass DS, Ross JM, Family F, Barbour J, James Simpson H, Coulibaly D, Hernandez J, Chen Y, Slavkovich V, Li Y, Graziano J, Santella RM, Brandt-Rauf P, Chillrud SN. 561 2010. Airborne particulate metals in the New York City subway: a pilot study to assess 562 563 the potential for health impacts. Environ. Res. 110:1-11. 564 11. Birenzvige A, Eversole J, Seaver M, Francesconi S, Valdes E, Kulaga H. 2003. Aerosol characteristics in a subway environment. Aerosol Science and Technoogy 565 566 **37**:210-220. 567 12. Gilleberg S, Faull JL, Graeme-Cook KA. 1998. A preliminary survey of aerial 568 biocontaminants at six London Underground stations. International Biodeterioration 569 & Biodegradation **41**:149–152. 13. Seino K, Takano T, Nakamura K, Watanabe M. 2005. An evidential example of 570 571 airborne bacteria in a crowded, underground public concourse in Tokyo. Atmospheric 572 Environment **39**:337–341.

573	14.	Hwang S, Yoon C, Ryu K, Paik S, Cho J. 2010. Assessment of airborne environmental
574		bacteria and related factors in 25 underground railway stations in Seoul, Korea.
575		Atmospheric Environment 44 :1658–1662.
576	15.	······································
577		bacteria at an underground subway station. Appl. Environ. Microbiol. 78 :1917–1929.
578	16.	Pace NR. 1997. A Molecular View of Microbial Diversity and the Biosphere. Science
579		276 :734 –740.
580	17.	Kesavan JS, Schepers DR. 2006. Characteristics and sampling efficiencies of Omni
581		3000 aerosol samplers. ECBC-TN-28; Edgewood Chemical Biological Center:
582		Aberdeen, MD.
583	18.	Lane DJ, Pace B, Olsen GJ, Stahl DA, Sogin ML, Pace NR. 1985. Rapid determination
584		of 16S ribosomal RNA sequences for phylogenetic analyses. Proc. Natl. Acad. Sci. U.S.A.
585		82 :6955–6959.
586	19.	Hamady M, Walker JJ, Harris JK, Gold NJ, Knight R. 2008. Error-correcting barcoded
587		primers for pyrosequencing hundreds of samples in multiplex. Nat. Methods 5:235–
588		237.
589	20.	Harris JK, Sahl JW, Castoe TA, Wagner BD, Pollock DD, Spear JR. 2010. Comparison
590		of Normalization Methods for Construction of Large, Multiplex Amplicon Pools for
591		Next-Generation Sequencing. Appl Environ Microbiol 76 :3863–3868.
592	21.	Frank DN. 2008. XplorSeq: a software environment for integrated management and
593		phylogenetic analysis of metagenomic sequence data. BMC Bioinformatics 9 :420.
594	22.	
595		implementation of barcoded primers for highly multiplexed DNA sequencing. BMC
596		Bioinformatics 10 :362.
597	23.	
598		Bioinformatics 25 :1335–1337.
599	24.	Haas BJ, Gevers D, Earl AM, Feldgarden M, Ward DV, Giannoukos G, Ciulla D,
600		Tabbaa D, Highlander SK, Sodergren E, Methé B, DeSantis TZ, Petrosino JF,
601		Knight R, Birren BW. 2011. Chimeric 16S rRNA sequence formation and detection in
602		Sanger and 454-pyrosequenced PCR amplicons. Genome Res. 21 :494–504.
603	25.	Li E, Hamm CM, Gulati AS, Sartor RB, Chen H, Wu X, Zhang T, Rohlf FJ, Zhu W, Gu C,
604		Robertson CE, Pace NR, Boedeker EC, Harpaz N, Yuan J, Weinstock GM,
605		Sodergren E, Frank DN. 2012. Inflammatory Bowel Diseases Phenotype, C. difficile
606		and NOD2 Genotype Are Associated with Shifts in Human Ileum Associated Microbial
607		Composition. PLoS ONE 7:e26284.
608	26.	Pruesse E, Quast C, Knittel K, Fuchs BM, Ludwig W, Peplies J, Glöckner FO. 2007.
609		SILVA: a comprehensive online resource for quality checked and aligned ribosomal
610		RNA sequence data compatible with ARB. Nucleic Acids Res. 35 :7188–7196.
611	27.	Magurran AE . Measuring Biological Diversity. Blackwell Publishing Company, Malden,
612		MA.
613	28	Grice EA, Kong HH, Conlan S, Deming CB, Davis J, Young AC, Bouffard GG,
614	_0.	Blakesley RW, Murray PR, Green ED, Turner ML, Segre JA. 2009. Topographical
615		and temporal diversity of the human skin microbiome. Science 324 :1190–1192.
616	29	Toivola M, Alm S, Reponen T, Kolari S, Nevalainen A . 2002. Personal exposures and
617	<u> </u>	microenvironmental concentrations of particles and bioaerosols. J Environ Monit
618		4:166-174.
010		

619	30.	Kujundzic E, Zander DA, Hernandez M, Angenent LT, Henderson DE, Miller SL.
620		2005. Effects of ceiling-mounted HEPA-UV air filters on airborne bacteria
621		concentrations in an indoor therapy pool building. J Air Waste Manag Assoc 55 :210–
622	0.1	
623	31.	Fabian M, Miller S, Reponen T, Hernandez M. 2005. Ambient bioaerosol indices for
624	22	indoor air quality assessments of flood reclamation. J. Aerosol Sci. 36 :763–783.
625	32.	
626		community resemblance methods differ in their ability to detect biologically relevant
627 628	22	patterns. Nat. Methods 7:813–819. Sogin ML, Morrison HG, Huber JA, Mark Welch D, Huse SM, Neal PR, Arrieta JM,
620 629	55.	Herndl GJ. 2006. Microbial diversity in the deep sea and the underexplored "rare
630		biosphere". Proc. Natl. Acad. Sci. U.S.A. 103 :12115–12120.
631	31	Kirk Harris J, Gregory Caporaso J, Walker JJ, Spear JR, Gold NJ, Robertson CE,
632	54.	Hugenholtz P, Goodrich J, McDonald D, Knights D, Marshall P, Tufo H, Knight R,
633		Pace NR . 2013. Phylogenetic stratigraphy in the Guerrero Negro hypersaline
634		microbial mat. ISME J 7:50–60.
635	35	Ganley ARD, Kobayashi T. 2007. Highly efficient concerted evolution in the
636	55.	ribosomal DNA repeats: total rDNA repeat variation revealed by whole-genome
637		shotgun sequence data. Genome Res. 17 :184–191.
638	36.	Maleszka R, Clark-Walker G. 1990. Magnification of the rDNA cluster in
639		Kluyveromyces lactis. Molecular and General Genetics 223 :342–344.
640	37.	Lee ZM-P, Bussema C 3rd, Schmidt TM. 2009. rrnDB: documenting the number of
641		rRNA and tRNA genes in bacteria and archaea. Nucleic Acids Res. 37 :D489–493.
642	38.	Potts M . 2001. Desiccation tolerance: a simple process? Trends Microbiol. 9 :553–559.
643	39.	, , , ,
644		seasonal dynamics of bacterial community in indoor environment. BMC Microbiol.
645		8 :56.
646	40.	Hospodsky D, Qian J, Nazaroff WW, Yamamoto N, Bibby K, Rismani-Yazdi H,
647		Peccia J . 2012. Human Occupancy as a Source of Indoor Airborne Bacteria. PLoS One 7 .
648	41.	
649		review. Indoor Built Environment 14 :5–16.
650		
651		
652	Fig	ure Legends
653		
654	Fig	ure 1. Phylum-level distribution of aerosolized microbiota observed at NYC
655	sub	way stations and Union Square Park (outside).
656		
657	The	e percent abundance is shown for phyla observed among the Sanger and the
658	pyro	osequence sequences extracted from impinged air sampled at Union Square Park, a
	. ,	

proxy for outdoor air (2A, 2C), and eight subway stations 2C, 2D). 2A, 2B: Sanger data
(bacteria, archaea, and eucarya). 2C, 2D: Pyrosequence data (bacteria only).

Figure 2. Comparison of species observed (Sobs) for Sanger and Pyrosequencedatasets.

664

665 Collectors curves of taxonomic classifications seen with sequence sample size. Sanger666 sequence values are in black. Pyrosequence values are in red.

667

Figure 3. Abundance of bacterial family-level aerosol taxa in NYC subway
 stations and Union Square Park (outside).

670

Family-level taxonomic categories greater than or equal to 1% abundance in the particular sample are shown ranked in abundance from top to bottom. The sample naming convention is: station name, followed by the station sample number (samples taken at both ends of platforms), followed by the date the sample was obtained. Complete taxonomic classifications are available in Table S1. The percent of each category is indicated by the number shown over the colored squares of the heatmap. Numbers do not add to 100% due to rounding.

- 678 Abbreviations used:
- 679 GC: Grand Central Station (456 and 7 Train platforms indicated)
- 680 GCMezz: Grand Central Station Mezzanine
- 681 Union14: Union Square and 14th Street Station
- 682 UnionSqPark: Union Square Park (proxy for out-of-doors).
- 683

Figure 4. Morisita-Horn diversity comparison of aerosol taxa in NYC subway
stations and Union Square Park (outside).

686

Family level taxonomic classifications of pyrosequence data were used to compute the Morisita-Horn beta diversity index for all sample pairs. Sample pairs with most overlap in all taxonomic categories are shown as red squares, while sample-pairs with least

- 691 least similar to other sites.
- 692 Abbreviations used:
- 693 GC: Grand Central Station (456 and 7 Train platforms indicated)
- 694 GCMezz: Grand Central Station Mezzanine
- 695 Union14: Union Square Park and 14th Street Station
- 696 UnionSqPark: Union Square Park (proxy for out-doors).
- 697

698Figure 5. Comparison of aerosol DNA sequences from NYC subway and Union699Square Park with DNA sequences obtained from human skin, water, and soil.

700

701 5A: Bacterial pyrosequence data were compared by BLAST to databases containing 702 sequences from the Human Skin Microbiome (HSM) (28) and sequences obtained from 703 ribosomal sequence database Silva 108 with source indicated as either soil or water. A 704 match between aerosol sequence and reference was identified whenever the 705 pyrosequence matched a database sequence with at least 95% overlap and by at least (columns in figure) 95% identity (genus-species level relationship) or at least 99% 706 707 identity (close species relationship). Sequence matches were sorted into eight (non-708 mutually exclusive) categories: those that did not match any of the three databases 709 went into "none", those sequences that matched both human skin and soil sequences 710 were assigned to "Skin, Soil", etc.

711

712 5B. Potential human skin sources of aerosol DNA sequences from NYC subway 713 stations were estimated by comparison of pyrosequence data by BLAST to a set of 714 Human Skin Microbiome databases created by random resampling of skin sites to the 715 size of the smallest skin site sequence set (~3,800 sequences/site). A match between 716 pyrosequence and skin site sequence was called when the pyrosequence had at least 717 95% overlap with the site sequence and 99% identity. The percent of these high 718 stringency matches are shown as a spectrum from red (> 25% of pyrosequences 719 match) to white (0% matches). Skin sites are defined by metadata in HSM GenBank 720 deposited sequences. The percent of skin-related sequences in each category is

indicated by the number imposed on the colored squares. Numbers do not add to100% due to rounding.

723

Figure 6. Comparison of aerosolized fungal DNA sequences from NYC subway
 stations and Union Square Park.

726

Subway data were pooled by averaging the percent abundances of fungal sequences
for each taxonomic category shown. The percent of each category is indicated by the
number imposed on the colored squares. Numbers do not add to 100% due to rounding.

Figure S1. Schematic of sample sites in and associated with the NYC subwaysystem.

733

Figure S2: Human skin sites of aerosol DNA sequences from NYC subwaystations.

736

737 Skin sites were estimated by comparison of pyrosequence data by BLAST to a 738 set of Human Skin Microbiome databases created by random resampling of skin sites to 739 the size of the smallest skin site sequence set (~3,800 sequences/site). A match 740 between pyrosequence and skin site sequence was called when the pyrosequence had 741 at least 95% overlap with the site sequence and 99% identity. The percent of these 742 high stringency matches in the different station samples are shown as a spectrum from 743 red (> 25% of pyrosequences match in the sample) to white (0% matches). Skin sites 744 are defined by metadata in HSM GenBank deposited sequences. The percent of each 745 category is indicated by the number imposed on the colored squares. Numbers do not 746 add to 100% due to rounding.

747

748 **Table S1: Metadata associated with samples.**

749

Table S2: Family-level taxonomic categories greater than or equal to 0.01%
 abundance overall shown ranked in abundance from top to bottom. The sample

- naming convention is: station name, followed by the station sample number (samples
- taken at both ends of platforms), followed by the date the sample was obtained.
- Numbers do not add to 100% due to rounding.
- 755













Basidiomycota//Agaricomycetes
Fungi-Other
Ascomycota-Other
Ascomycota//Trichocomaceae
Basidiomycota//Wallemia
Dikarya-Other
Ascomycota//Dothideomycetes
Ascomycota//Davidiellaceae
Basidiomycota-Other
Ascomycota//Eurotiales
Basidiomycota//Tremellomycetes
Ascomycota//Capnodiales
Ascomycota/Pezizomycotina
Ascomycota//Saccharomycetales
Basidiomycota/Agaricomycotina
Ascomycota//Sordariomycetes
Ascomycota//Hypocreales

38	30	14
11	13	14
12	13	
7	8	12
0		i i
4	5	10
4	4	E F
7	3	8
2	3	Ŭ
0	3	
0	2	6
0	2	
0	2	4
0	7 5 4 3 3 2 2 2 2 1 1 1	12 10 8 6 4
0	1	2
0 4 7 2 0 0 0 0 0 0 0 0 0 4 2	1	
2	1	0